# ASSESSMENT OF DEFORESTATION AND LAND COVER CHANGE IMPACTS ON FLOOD PEAK DISCHARGE IN MADURU OYA BASIN, SRI LANKA

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#### **ABSTRACT**

# Assessment of Deforestation and Land Cover Change Impacts on Flood Peak Discharge in Maduru Oya Basin, Sri Lanka

Population growth raises demand and competition for water resources and food stocks while it changes the landuse types by anthropogenic activities to adopt applicable measures for supplying water for domestic, agricultural, and industrial purposes. These changes alter the hydrological response of the river basins and can impose the communities to severe environmental risks like floods and landslides. Therefore, understanding of landuse change is crucial to study river basins' behavior and take mitigatory measures. The study presented here quantifies and analyzes the historical deforestation and landuse/landcover (LULC) change impacts on flood peak discharge of the Maduru Oya river basin, Sri Lanka using Hydrologic Engineering Centre-Hydrologic Modeling System (HEC-HMS) and remote sensing techniques. The Landsat Multispectral Scanner (MSS), Thematic Mapper (TM), and Operational Land Imager-thermal Infrared Sensor (OLI-TIRS) images are acquired in 1976, 1994, 2009, 2021 and classified using maximum likelihood algorithm of supervised classification.

The analysis of LULC change revealed that LU change was faster and in high magnitude from 1976 to 1994 compared to the remaining period to 2021. The LULC change quantification by analyzing each scenario revealed a 24.9% deforestation while a 2.2%, 9.8%, 8.4%, and 4.5% increase in homestead/garden, paddy, scrubland, and water body between 1976 to 1994, respectively. The deforestation further continued to a rate of 4.1% and a 2.0% decrease in water bodies was also found in 2009 while homestead/garden, paddy, and scrubland continued to increase by 3.5%, 1.4%, and 1.5% compared to 1994 landuse scenario, respectively. In contrast, the 2021 landuse scenario indicated a 7.6% decrease in scrubland while 3.6%, 0.5%, 1.5%, and 1.8% increase in forests, homestead/garden, paddy, and water bodies. The classified images were subjected to accuracy assessment. The overall accuracy of 82%, 84%, 88%, and 91% are found for 1976, 1994, 2009, and 2021 LU scenarios while having kappa coefficients of 0.78, 0.80, 0.85, and 0.89 for respective years. The Normalized Difference Vegetation Index (NDVI) assessment of scenarios corresponds to the landuse classified images.

An event-based HEC-HMS model is used to simulate the flood events in the Welikanda catchment of the Maduru Oya river basin. The model is calibrated and validated using the 1976 landuse and then the subsequent landuses are applied to study LU change impact on flood peak discharge. For model performance evaluation, the Nash-Sutcliffe, RMSE Observations Standard Deviation Ratio (RSR) Percent Bias (PBIAS), and the Coefficient of determination (R²) were exploited. The average NSE, RSR, PBIAS, and R² values of 0.92, 0.25, 17.60, and 0.94 achieved in calibration and 0.73, 0.50, -3.03, and 0.78 are found in the validation which all can be rated very good performance except for PBIAS as satisfactory in calibration and NSE as good in the validation. The land cover change resulted in an increase (22.3%) in flood peak from 842 m³/s in 1976 to 1,030 m³/s in 2021. As a result of the landcover changes, the volume is also increased (42.3%) from 178.16 MCM in 1976 to 253.52 MCM in 2021. This study provides useful information for land and water managers, forests conservation units, and hydrologist to understand the LULC change impacts on floods and paves the way for broad LU and hydrological studies in Sri Lanka which are rarely conducted. The same approach can be applied in different parts of Sri Lanka which are exposed to severe LU changes.

Keywords: Data Scarcity, Forests, HEC-HMS, Hydrological Modeling, Satellite Observations, Water Cycle

#### **DEDICATION**

I would like to dedicate this study to my first teachers - my father and mother, in whom the existence gets a meaning, who have always stood up like the mountains against the challenges of life and have supported their children. When they were hardly surviving, they bought books and pens for their children to read, write and learn. It is with them that I feel big like the sky to spread the shade of kindness, smile, and supporting others. I owe them whatever I have in my life.

I also would like to dedicate this study to my family members, my brothers, and sisters who never spared to give me a hand when I was facing difficult times in my life.

I would like to honor the memory of my beloved late professor Ibrahim Najaf and my bachelor's degree supervisor Dr. Mohammad Hadi Asadi who have shaped my engineering life and dedicate this work to them.

Lastly, I would like to dedicate this work to my sweet homeland - Afghanistan in which I have grown up and do not know when to see it again, and Sri Lanka - my second homeland, the country that I have lived a life in so far.

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### LIST OF ABBREVIATIONS

AMP Accelerated Mahaweli Program

ANN Artificial Neural Networks

C3S Copernicus Climate Change Service

CN Curve Number

DEM Digital Elevation Model

DS Direct Sampling

ECMWF European Centre for Medium-Range Weather Forecasts

EDA Exploratory Data Analysis

EDASM European Digital Archive of Soil Maps

ERA 40 40-yr European Centre for Medium-Range Weather Forecasts Re-

analysis

ERA5 Fifth Generation of Atmospheric Reanalysis of the Global Climate

ERA-Interim Represents a Third Generation Reanalysis

ET Evapotranspiration

ETM+ Enhanced Thematic Mapper Plus

FAO Food and Agriculture Organization

FFPO Fauna and Flora Protection Ordinance

GFDS Global Flood Detection System

GIS Geographical Information System

GSFC Goddard Space Flight Center

HEC-HMS Hydrologic Engineering Center - Hydrologic Modeling System

HRES High-Resolution Forecast

LULC Landuse/Landcover

MDP Mahaweli Development Program

MERRA Modern Era Retrospective-Analysis for Research and Applications

MI Multiple Imputation

MLC Maximum Likelihood Classifier

MLP Multilayer Perceptron

MNN Multivariate Nearest-Neighbor

MNP Maduru Oya National Park

MSL Mean Sea Level

MSS Multispectral Scanner

NASA National Aeronautics and Space Administration.

NCEP National Centers for Environmental Prediction

NDVI Normalized Difference Vegetation Index

NIR Near-Infrared Reflactance

NSE Nash-Sutcliffe Simulation Efficiency

OLI Operational Land Imager

PBIAS Percentage Bias

PRF Peak Rate Factor

R<sup>2</sup> Coefficient of Determination

RED Red Reflectance

REGEM Regularized Expectation–Maximization Algorithm

RSR Root Mean Square Error Observations Standard Deviation Ratio

SCS Soil Conservation Service

SOM Self-organizing Map

SRTM Shuttle Radar Topography Mission

Tc Time of Concentration

TM Thematic Mapper

UH Unit Hydrograph

UN-REDD United Nations-Reducing Emissions from Deforestation aAnd

Degradation

USACE United States Army Corps of Engineers

USGS United States Geological Survey